Welcome to Psy 652 Lab!

Module 4:

Statistical Power

Objectives

- Explain statistical power
- Learn to calculate sample sizes from power & effect sizes via:
 - Murphy, Myors & Wolach (2014) Appendix E
 - G*Power

We will NOT be using R today!

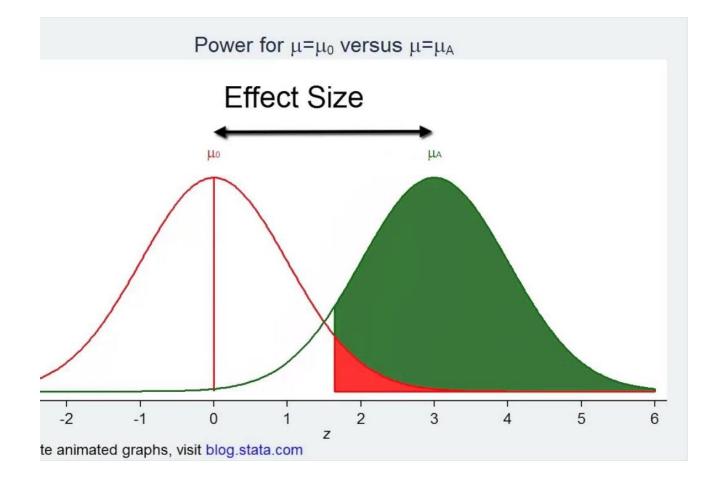
(But you can do power calculations in R using the "pwr" package)

What is statistical power?

- Power = The probability of finding an effect (Assuming there is an effect) from our sample.
 - So, a power of .80 means that we have an 80% chance of detecting the effect in our sample given the effect is there.
 - In general, we desire to have a power level of .80 or better. Anything under .80 is generally considered insufficiently powered.
- We often use power a-priori to determine what a sufficient sample size will be. If you are applying for a grant, you will likely need a power analysis!
 - To determine **sample size**, we need 3 things:
 - 1. An alpha value (α) The probability of getting a type I error (Usually set α = .05 in psychology)
 - 2. An **effect size** (Determined through the literature Meta analyses!)
 - 3. A desired **power (1 \beta) level** (Usually set to .80)

What is an effect size?

- Effect size = The standardized difference between your groups or the proportion of variance explained.
- There are many type of effect sizes (Cohen's-d, PV, Odds ratios, R² etc.)
 - In this lesson, we will use PV and Cohen's-d



Effect size, α , sample size, study complexity, and power: A relationship

- As effect size increases, so does power
- As α increases, so does power
 - Consequence: You increase the chance of making a type I error
 - A type I error is the chance to say an effect exists, when it does not exist
- As sample size increases, so does power
- As study complexity increases, power decreases
 - For example: All else equal, a study with 4 comparison groups will have less power than a study with 3 comparison groups

Today we will be covering two methods to calculate sample sizes

- 1. Murphy, Myors & Wolach (2014) Appendix E (Available in Canvas)
- 2. G*Power (A downloadable power calculator program for Mac & Windows)
 - https://www.psychologie.hhu.de/arbeitsgruppen/allgemeine-psychologie-und-arbeitspsychologie/gpower.html

Appendix E - The dfErr Needed for Power = .80 (Alpha = 0.05) in Tests of Traditional Null Hypothesis

									df	Нур								
PV	d	1	2	3	4	5	6	7	8	9	10	12	15	20	30	40	60	120
0.1	0.00	775	0.50	1070	11.05	1000	1221	1204	1 4 5 1	1504	1500	1.070	1005	1000	0200	0565	2007	4016
.01	0.20															2565		
.02	0.29	385		533	579	627	662	694	722	762	787	832	909	993		1313		2010
.03	0.35	255		353	384	416	439	460	479	505	522	552	603	660	782			1341
.04	0.41	190		263	286	310	328	343	358	377	390	413	451	494	585	654		1031
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.07	0.55	106		148	161	174	184	193	204	212	220	233	255	285	331	371	440	601
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.19	0.97	36	44	50	55	59	63	67	70	73	77	82	90	101	119	136	163	227
.20	1.00	34	42	47	52	56	60	64	67	69	73	77	85	96	112	129	154	214
.22	1.06	30	37	42	47	51	54	57	60	62	65	70	76	86	102	116	139	194
.24	1.12	27	34	39	42	46	49	52	54	57	59	63	69	78	93	105	128	178
.26	1.19	25	31	35	38	42	44	47	49	52	54	58	63	71	85	96	117	163
.28	1.25	22	28	32	35	38	41	43	45	48	49	53	58	65	78	90	107	152
.30	1.31	21	26	30	32	35	37	40	42	44	45	49	53	61	72	83	100	142
.32	1.37	19	24	27	30	33	35	37	39	40	42	45	50	56	68	76	93	131
.34	1.44	18	22	25	28	30	32	34	36	38	39	42	46	52	63	72	87	123
.36	1.50	16	20	23	26	28	30	32	33	35	37	39	43	49	59	67	81	115
.38	1.57	15	19	22	24	26	28	30	31	33	34	37	40	45	55	62	76	108
.40	1.63	14	18	20	23	24	26	28	29	31	32	35	38	43	52	59	72	101
.42	1.70	13	17	19	20	23	24	26	27	29	30	32	36	40	48	55	67	96
.44	1.77	12	15	18	20	21	23	24	26	27	28	30	33	38	45	52	64	91
					20		20		20	/	20						0.1	

Method 1:
Murphy,
Myors &
Wolach
(2014)
Appendix E

Appendix E - The dfErr Needed for Power = .80 (Alpha = 0.05) in Tests of Traditional Null Hypothesis 10 12 1260 1331 1394 1451 1504 580 1670 1825 1992 832 0.35 479 505 358 377 390 413 451 494 285 .05 261 300 310 359 0.51 125 154 236 249 257 298 333 388 220 255 285 331 .08 248 .09 0.60 81 100 113 124 101 110 0.67 0.70 91 101 .11 This table assumes you set an alpha 0.74 .14 0.81 value at .05 & a Power of .80 0.84 .16 0.87 .17 0.91 .18 0.94 .19 .20 1.00 1.06 .24 1.12 1.19 .28 .30 1.31 .34 .36 1.50 1.63 35 .40 1.70

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.02	120	60	40	30	20	15	12	10	Нур 9	df) 8	7	6	5	4	3	2	1	d	PV
.03	4016	3027	2565	2302	1992	1825	1670	1580	1504	1451	1394	1331	1260	1165	1072	952	775	0.20	.01
.04	2010	1413	1313	1176	993	909	832	787	762	722	694	662	627	579	533	473	385	0.29	.02
.05	1341	1008	874	782	660	603	552	522	505	479	460	439	416	384	353	313	255	0.35	.03
.06 0.51 125 154 173 189 204 216 227 236 249 257 273 298 333 388 434 514 .07 0.55 106 131 148 161 174 184 193 204 212 220 233 255 285 331 371 440 .08 0.59 92 114 128 140 152 160 168 178 185 191 203 222 248 289 324 384 .09 0.60 81 100 113 124 134 142 149 157 164 169 179 196 220 256 287 341 .10 0.67 73 90 101 110 120 127 133 141 146 152 161 176 197 230 258 312 .11 0.70 66 81 91 101 108 115 120 127 132 13	1031	774	654	585	494	451	413	390	377	358	343	328	310	286	263	233	190	0.41	.04
.07 0.55 106 131 148 161 174 184 193 204 212 220 233 255 285 331 371 440 .08 0.59 92 114 128 140 152 160 168 178 185 191 203 222 248 289 324 384 .09 0.60 81 100 113 124 134 142 149 157 164 169 179 196 220 256 287 341 .10 0.67 73 90 101 110 120 127 133 141 146 152 161 176 197 230 258 312 .11 0.70 66 81 91 101 108 115 120 127 132 137 148 159 178 208 238 283 .12 0.74 83 92 99 104 110 116 121 125 135 145 </th <th>825</th> <th>618</th> <th>522</th> <th>466</th> <th>402</th> <th>359</th> <th>329</th> <th>310</th> <th>300</th> <th>285</th> <th>273</th> <th>261</th> <th>247</th> <th>228</th> <th>209</th> <th>186</th> <th>151</th> <th>0.46</th> <th>.05</th>	825	618	522	466	402	359	329	310	300	285	273	261	247	228	209	186	151	0.46	.05
.08 0.59 92 114 128 140 152 160 168 178 185 191 203 222 248 289 324 384 .09 0.60 81 100 113 124 134 142 149 157 164 169 179 196 220 256 287 341 .10 0.67 73 90 101 110 120 127 133 141 146 152 161 176 197 230 258 312 .11 0.70 66 81 91 101 108 115 120 127 132 137 148 159 178 208 238 283 .12 0.74 60 74 83 92 99 104 110 116 121 125 135 145 163 190 218 259 .13 0.77 55 68 76 84 90 96 101 106 111 115	687	514	434	388	333	298	273	257	249	236	227	216	204	189	173	154	125	0.51	.06
.09 0.60 81 100 113 124 134 142 149 157 164 169 179 196 220 256 287 341 .10 0.67 73 90 101 110 120 127 133 141 146 152 161 176 197 230 258 312 .11 0.70 66 81 91 101 108 115 120 127 132 137 148 159 178 208 238 283 .12 0.74 60 74 83 92 99 104 110 116 121 125 135 145 163 190 218 259 .13 0.77 55 68 76 84 90 96 101 106 111 115 124 133 150 178 200 238 .14 0.81 50 62 70 78 83 88 94 98 102 106 1	601	440	371	331	285	255	233	220	212	204	193	184	174	161	148	131	106	0.55	.07
.10	525	384	324	289	248	222	203	191	185	178	168	160	152	140	128	114	92	0.59	.08
.11 0.70 66 81 91 101 108 115 120 127 132 137 148 159 178 208 238 283 122 0.74 60 74 83 92 99 104 110 116 121 125 135 145 163 190 218 259 130 0.77 55 68 76 84 90 96 101 106 111 115 124 133 150 178 200 238 144 0.81 50 62 70 78 83 88 94 98 102 106 114 123 138 165 185 220 155 0.84 47 58 65 72 77 82 87 91 95 98 106 115 129 153 172 205 16 0.87 43 54 61 67 72 76 81 85 88 92 99 107 120 143 161 192 177 0.91 40 50 57 63 68 72 76 80 83 86 93 101 112 134 151 183 18 0.94 38 47 53 59 63 67 71 75 78 81 87 96 106 126 142 172 19 0.97 36 44 50 55 59 63 67 70 73 77 82 90 101 119 136 163 120 1.00 34 42 47 52 56 60 64 67 69 73 77 85 96 112 129 154 122 1.06 1.00 34 42 47 51 54 57 60 62 65 70 76 86 102 116 139 128 1.25 1.26 30 32 35 38 41 43 45 48 49 53 58 65 78 90 107 128 1.25 1.25 1.25 1.25 1.25 1.25 1.25 1.25	466	341	287	256	220	196	179	169	164	157	149	142	134	124	113	100	81	0.60	.09
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.14	355	259																	
.15	327																		
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.19 0.97 36 44 50 55 59 63 67 70 73 77 82 90 101 119 136 163 .20 1.00 34 42 47 52 56 60 64 67 69 73 77 85 96 112 129 154 .22 1.06 30 37 42 47 51 54 57 60 62 65 70 76 86 102 116 139 .24 1.12 27 34 39 42 46 49 52 54 57 59 63 69 78 93 105 128 .26 1.19 25 31 35 38 42 44 47 49 52 54 58 63 71 85 96 117 .28 1.25 22 28 32 35 38 41 43 45 48 49 53 58 65 78 90 107 .30 1.31 21 26 30 32 35 37 40 42 44 45 49 53 61 72 83 100 .30	251																		
.20 1.00 34 42 47 52 56 60 64 67 69 73 77 85 96 112 129 154 .22 1.06 30 37 42 47 51 54 57 60 62 65 70 76 86 102 116 139 .24 1.12 27 34 39 42 46 49 52 54 57 59 63 69 78 93 105 128 .26 1.19 25 31 35 38 42 44 47 49 52 54 58 63 71 85 96 117 .28 1.25 22 28 32 35 38 41 43 45 48 49 53 58 65 78 90 107 .30 1.31 21 26 30 32 35 37 40 42 44 45 49 53 61 72 83 100	236																		
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	142																		
.52 1.57 17 24 27 50 55 55 57 57 40 42 45 50 50 00 70 55	131																		
.34 1.44 18 22 25 28 30 32 34 36 38 39 42 46 52 63 72 87	123	87																	
	115	81																	
	108	76																	
	101	72																	
	96	67																	
	91	64																	

 $Red = df_{Hyp}$

Orange = Effect size (d or PV)

 $Green = df_{Err}$

*Terms defined on next slide

Term definitions

- df_{hyp} : Is an index of the complexity of the problem. For example, when comparing the 2 groups, $df_{hyp} = 1$. When comparing 5 groups, $df_{hyp} = 4$. If you are evaluating 7 predictors of an outcome, your $df_{hyp} = 6$.
- Effect size: The proportion of variance explained (PV of .20 = 20% of the variance explained) or the standardized difference between groups (d of .20 = there are .20 standard deviations between the groups).
- df_{err}: The degrees of freedom for the estimate of error used in the test.
- Sample size: $N = df_{hyp} + df_{err} + 1$

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 THE END PRODUCT!

How to use Appendix E to get sample size

- 1. Identify your df_{Hyp}
 - The number or groups (or predictors) minus 1 (groups 1)
- 2. Determine your effect size
 - Normally found in the literature via meta analyses
- 3. Determine the df_{Err} using your df_{Hvp} and effect size
- 4. Calculate the sample size
 - $N = df_{hyp} + df_{err} + 1$

An example

• You are conducting a study that has 2 groups in it (an experimental and control group). A meta analytic review has recently shown that the effect size is shown to be PV = .10. How many participants are needed to reach a desired power of .80 with an alpha of .05?

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- $df_{Hyp} = Groups -1 = 2 1 = 1$
- PV = **.10**
- Next step: Find the df_{Err}

Finding the df_{Err}

Appendix E - The dfErr Needed for Power = .80 (Alpha = 0.05) in Tests of Traditional Null Hypothesis

										дур								
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.28	1.25	22	28	32	35	38	41	43	45	48	49	53	58	65	78	90	107	152
.30	1.31	21	26	30	32	35	37	40	42	44	45	49	53	61	72	83	100	142
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.38	1.57	15	19	22	24	26	28	30	31	33	34	37	40	45	55	62	76	108
.40	1.63	14	18	20	23	24	26	28	29	31	32	35	38	43	52	59	72	101
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. 44	1.77	12	15	18	20	21	23	24	26	27	28	30	33	38	45	52	64	91

• $df_{Frr} = 73$

• Sample Size: $df_{hyp} + df_{Err} + 1$

• 1 + 73 + 1 = 75

We need 75
 participants to
 reach a power of
 .80

Another example

You are running an observational study, For your analyses, you plan to use 7 variables to predict one outcome. Your advisor tell you the general effect size for the predictor of interest and outcome is PV = .23. How many participants are needed to reach a power of .80 with an alpha of .05?

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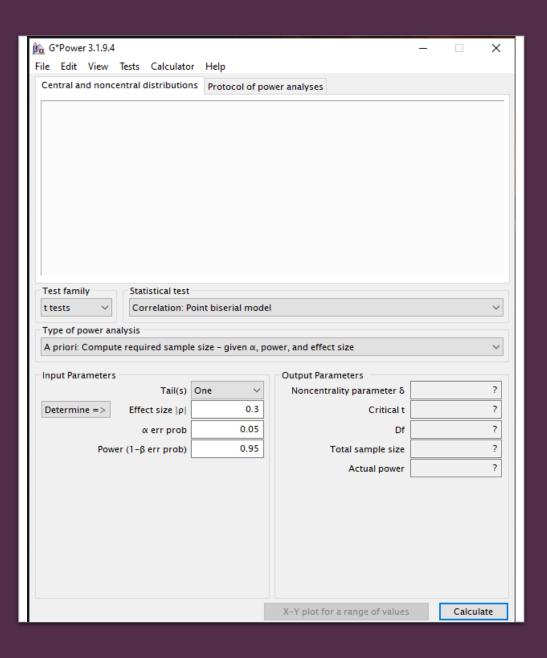
- $df_{Hyp} = predictors -1 = 7 1 = 6$
- PV = .23
- Next step: Find the df_{Err}

Finding the df_{Err}

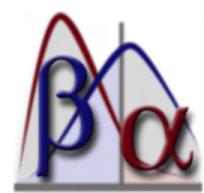
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.17	0.91	40	50	57	63	68	72	76	80	83	86	93	101	112	134	151	183	251	
.18	0.94	38	47	53	59	63	67	71	75	78	81	87	96	106	126	142	172	236	
.19	0.97	36	44	50	55	59	63	67	70	73	77	82	90	101	119	136	163	227	
.20	1.00	34	42	47	52	56	60	64	67	69	73	77	85	96	112	129	154	214	
.22	1.06	30	37	42	47	51	54	57	60	62	65	70	76	86	102	116	139	194	
.24	1.12	27	34	39	42	46	49	52	54	57	59	63	69	78	93	105	128	178	
.26	1.19	25	31	35	38	42	44	47	49	52	54	58	63	71	85	96	117	163	
.28	1.25	22	28	32	35	38	41	43	45	48	49	53	58	65	78	90	107	152	
.30	1.31	21	26	30	32	35	37	40	42	44	45	49	53	61	72	83	100	142	
.32	1.37	19	24	27	30	33	35	37	39	40	42	45	50	56	68	76	93	131	
.34	1.44	18	22	25	28	30	32	34	36	38	39	42	46	52	63	72	87	123	
.36	1.50	16	20	23	26	28	30	32	33	35	37	39	43	49	59	67	81	115	
.38	1.57	15	19	22	24	26	28	30	31	33	34	37	40	45	55	62	76	108	
.40	1.63	14	18	20	23	24	26	28	29	31	32	35	38	43	52	59	72	101	
.42	1.70	13	17	19	20	23	24	26	27	29	30	32	36	40	48	55	67	96	
. 44	1.77	12	15	18	20	21	23	24	26	27	28	30	33	38	45	52	64	91	

- $df_{Err} = 54$
- Sample Size: $df_{hyp} + df_{Err} + 1$
- 6 + 54 + 1 = 61
- We need 61
 participants to
 reach a power of
 .80



Method 2: G*Power



G*Power

- Great Power calculator
- Allows you to Calculate sample size (Given power, α , and effect size)
- You can also calculate the power of a study (sample size, α , and effect size)
- ...And more!



A-priori vs post-hoc power analysis

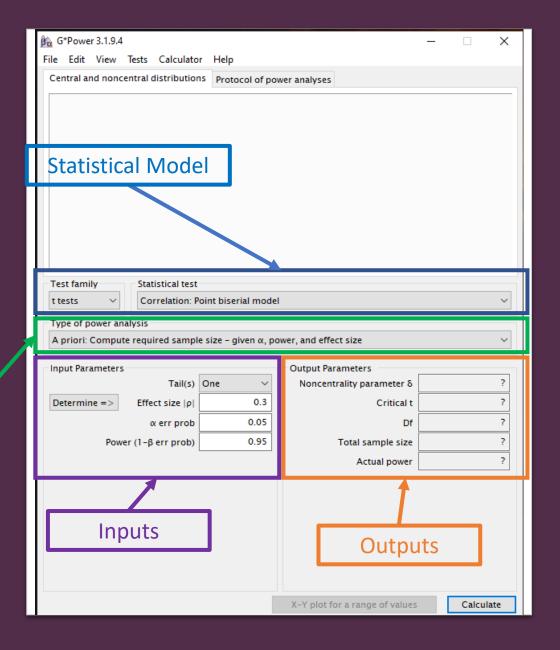
• A-priori = When you run the power analysis *BEFORE* you run the study to determine the sample size.

• Post-hoc = When you run the power analysis AFTER you run the study to determine how much power the study had.

A-priori is preferred, but sometimes we find ourselves in situations where the only option we have is a post-hoc analysis.

The G*Power Calculator

Type of analysis (a-priori or posthoc... and more!)



• Your planned study is a randomized control treatment assessing the mean differences of sexual knowledge scores between participants that took a 12-week sexual education class vs. those in a control group (No class). An independent samples t-test will be used to assess this difference. You want to use an alpha level of .05 and a recent meta-analysis that came out has shown that sexual education classes show an effect size of 0.12. What sample size would be needed to achieve a power level of .80?

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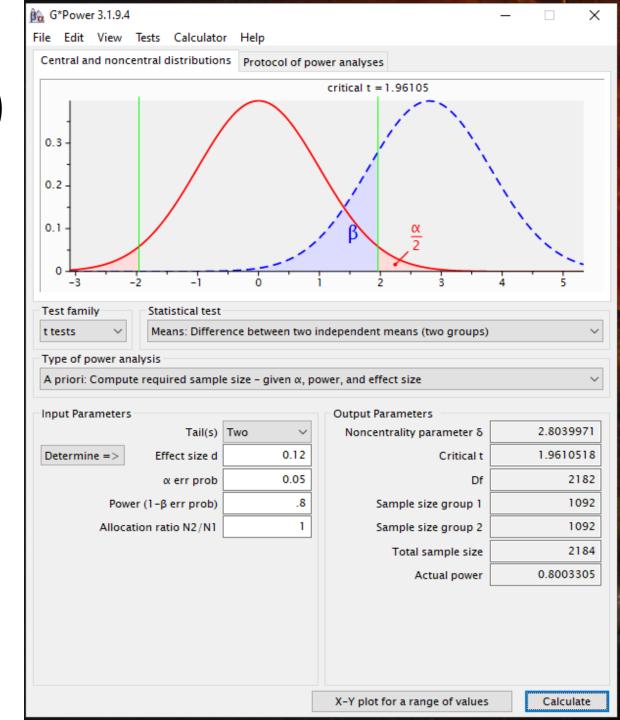
<u>Tails</u> = Two (Because we never indicated a direction of effect)

Effect size
$$= .12$$

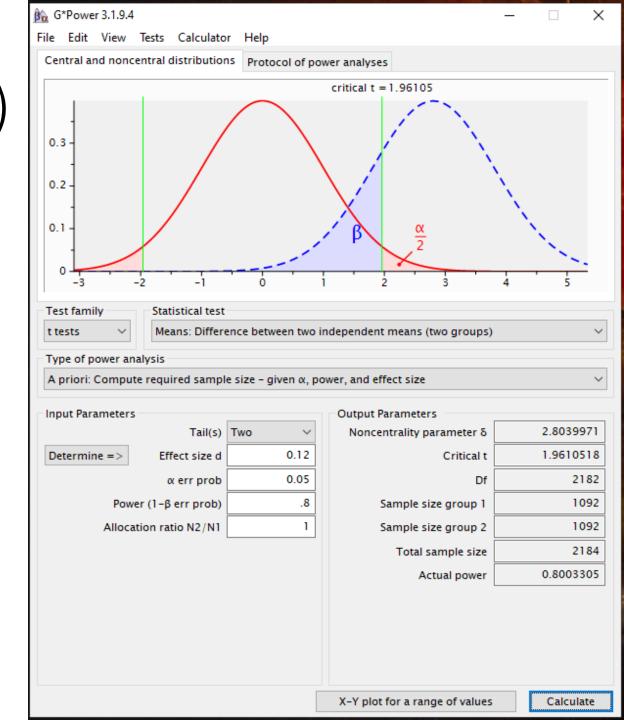
$$\alpha = .05$$

Power =
$$.8$$

<u>Allocation ratio</u> = 1 (Change this only if you suspect your group sizes will be different)



Total sample size needed = 2184 for a desired power of .80!



• You are focused creating study with 3 groups trying to see if different yoga interventions have any effect on eating habits in college students. The plan is to conduct a one-way ANOVA. Generally, the expected effect size for interventions like these on eating habits is 0.15. Using an alpha value of .05, what sample size would be needed to obtain a power of .80?

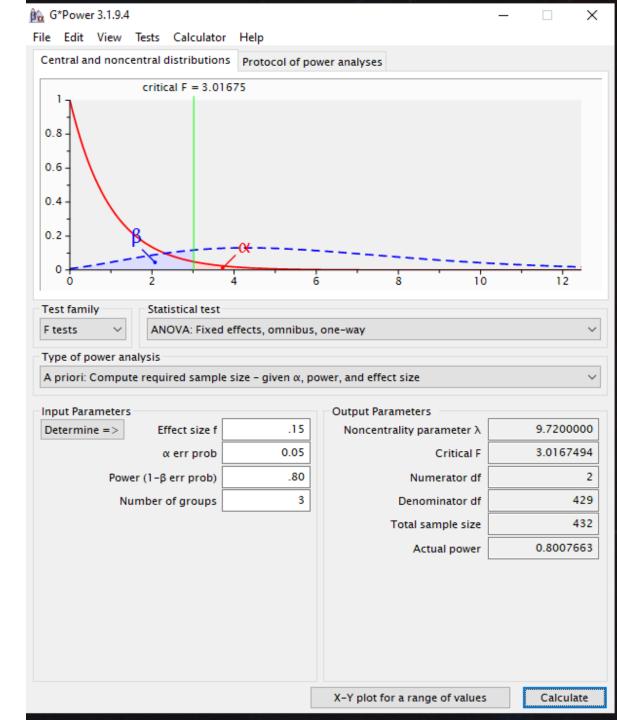
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• **Effect size** = .15

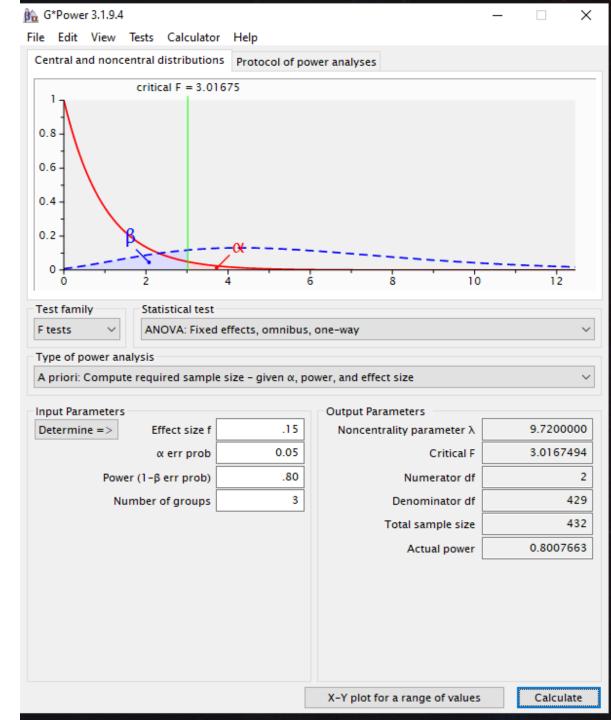
• $\alpha = .05$

• **Power** = .80

• Number of groups = 3



Total sample size needed = 432 for a desired power of .80!



• You recently ran an experimental study and failed to find significance between the control and treatment group when alpha was set at .01. The completed study yielded an effect size of .25 between the two groups. You used an independent samples t-test. Your sample had 200 participants in each group (400 in total). What was the power of your study?

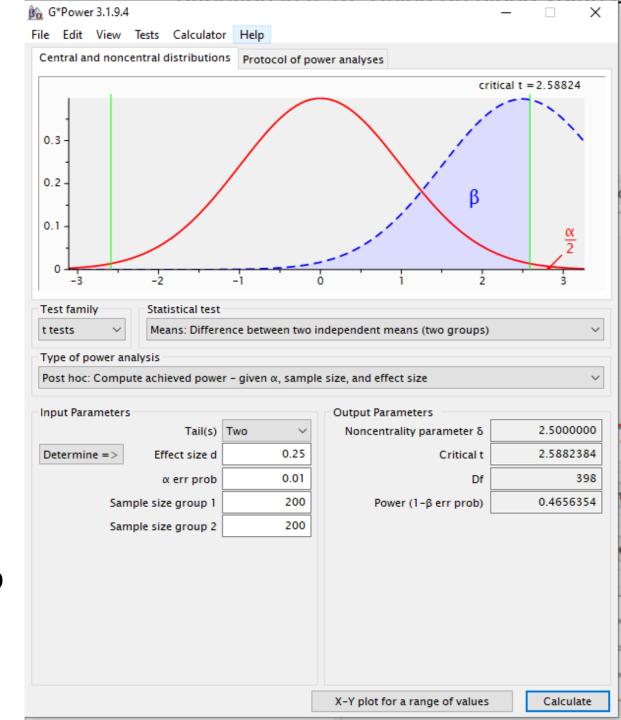
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• <u>Tails</u> = Two (Because we never indicated a direction of effect)

• Effect size = .25

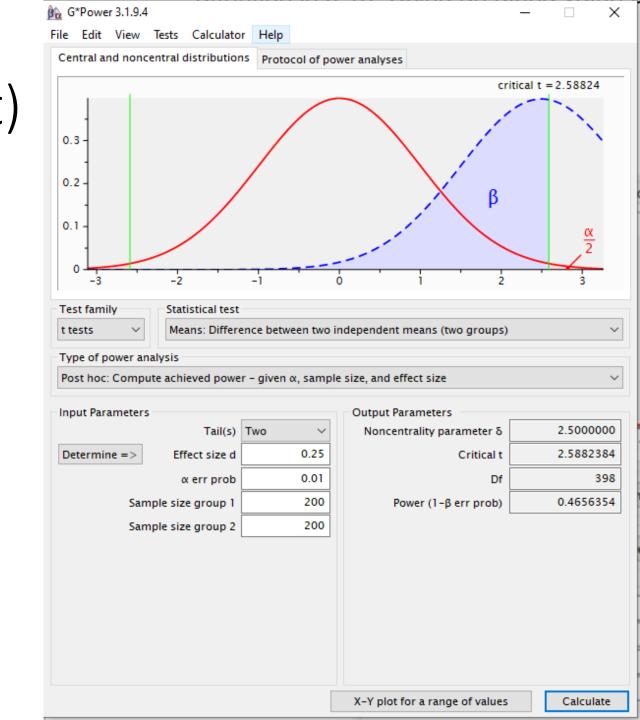
• $\alpha = .01$

• Sample size (1 & 2) = 200 in each group



Your study had power of .465, meaning you only had a 46.5% chance of detecting the effect.

This was extremely underpowered!



 Your friend conducted a study to compare the impact of 5 different yoga workouts. They recruited a sample of 250 undergraduate students. 50 participants were each assigned to one of the workouts (each participant only did one of the workouts) and they were asked to self-rate their mood after the work out. After your friend collected all of the data, they conducted a one-way ANOVA to compare the mean mood rating across the five types of yoga workouts. At a significance threshold of alpha = .05, the results were nonsignificant. Previous literature indicates that the effect size for the mean difference across the food groups should be around f = 0.1. Was their study sufficiently powered to detect an effect of f = 0.1. if it exists, across the four groups?

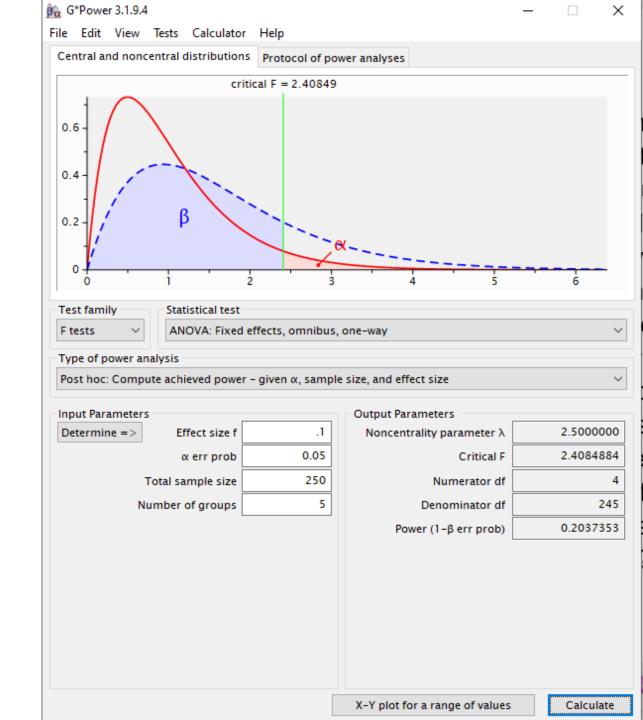
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• **Effect size** = .10

• $\alpha = .05$

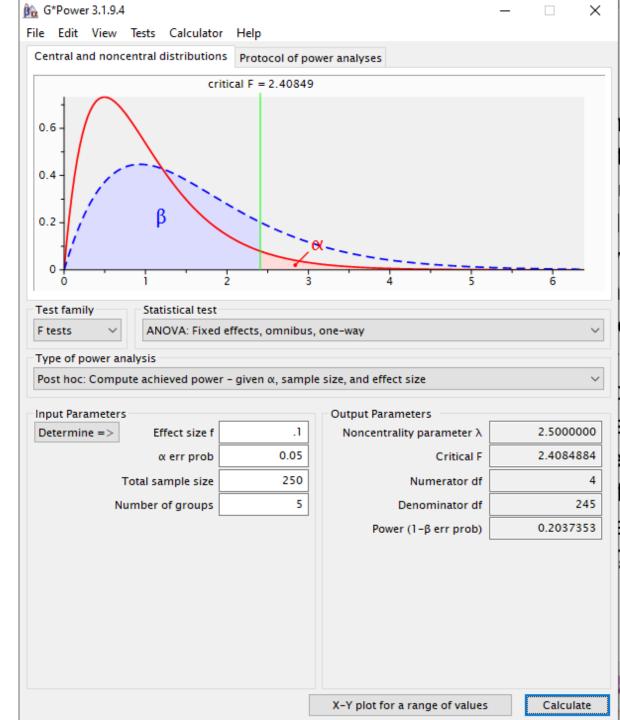
• **Sample size** = 250

• Number of groups = 5



Your study had power of .204, meaning you only had a 20.4% chance of detecting the effect.

Again, this was extremely underpowered!



In conclusion

- Power is the probability you will detect the effect (i.e. a power of .70 means you have a 70% chance of detecting the effect)
- Power analyses are essential to any study
- Effect size, alpha value, and sample size drive how much power you have
- You learned two methods to calculating power:
 - Murphy, Myors & Wolach (2014) Appendix E
 - G*Power
- *Now do the assignment on Canvas!*